

# A Study of PDV Data: Errors and Uncertainties versus Acceleration and Noise

Oliver T. Strand

*New Mexico Operations, Los Alamos*

*PDV Workshop*

*Santa Fe, NM*

*May 14–18, 2018*

This work was done in part by National Security Technologies, LLC, under Contract No. DE-AC52-06NA25946, and by Mission Support and Test Services, LLC, under Contract No. DE-NA0003624, with the U.S. Department of Energy. DOE/NV/03624--0089.

# Introduction

## Topics

Consider a range of accelerations and noise in PDV data.

Look at errors and uncertainties in velocity.

Look at errors and uncertainties in acceleration.

## Method

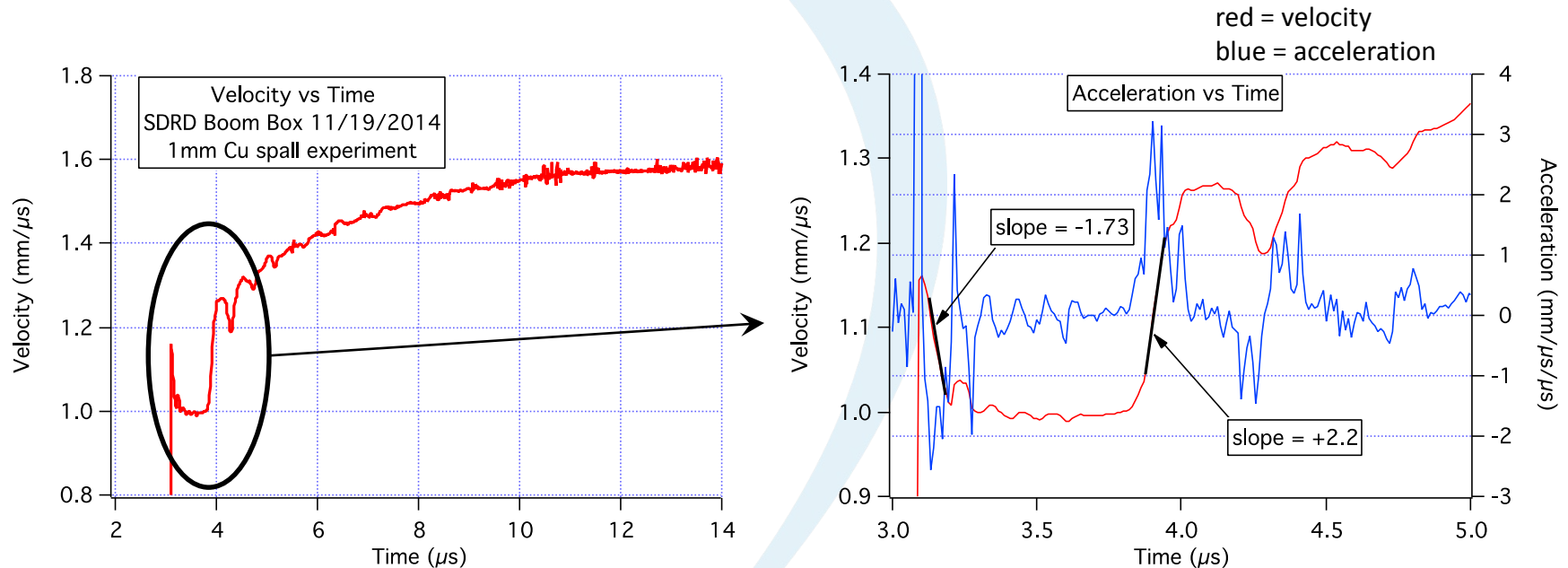
Determine a range of accelerations in actual shock physics experiments.

Build velocity profiles with appropriate ranges of acceleration.

Build beat waveforms with different amounts of noise.

Perform Fourier transforms, extract data, and compare to input values.

# Look at range of accelerations in HE-driven data

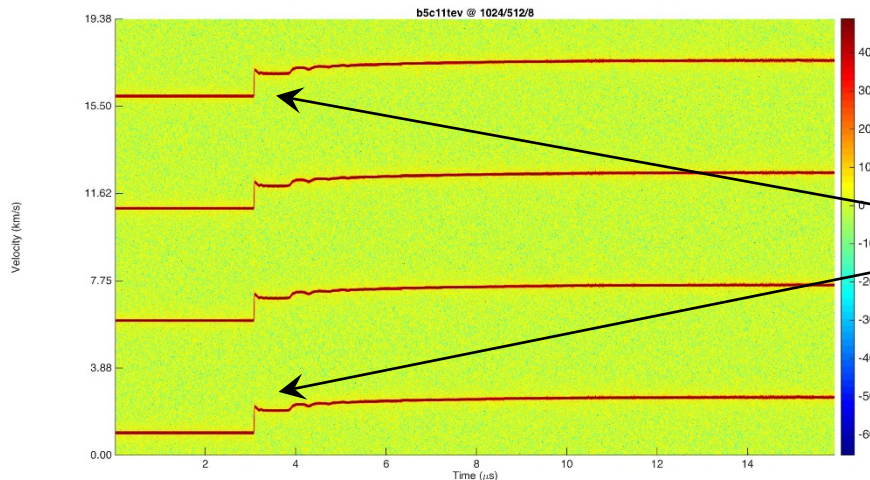


Accelerations range from  $-2$  mm/ $\mu$ s/ $\mu$ s to  $+2$  mm/ $\mu$ s/ $\mu$ s.  
Linear fits to velocity look good  $\geq$  constant acceleration.

Many thanks to Ed Daykin (MSTS) for permission to use this data.

# Other considerations for this study

Data could be shifted to different velocities in the spectrogram  
(frequency multiplexing)



Are the errors  
and uncertainties  
in the upper part  
of the spectrogram  
the same as in  
the lower part?

Summary: Acceleration range of  $-2$  to  $+2$  mm/ $\mu$ s/ $\mu$ s.  
Constant acceleration.  
Data could be frequency shifted.

Conclusion: Choose accelerations that range from  $-5$  to  $+5$  mm/ $\mu$ s/ $\mu$ s.  
Limit study to constant accelerations.  
Examine entire velocity range from 0 to near Nyquist.

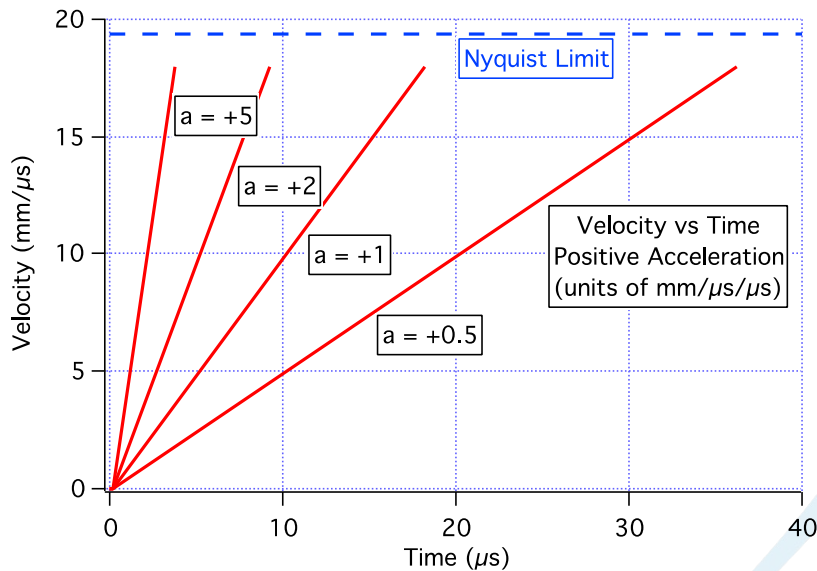
# Build velocity profiles with constant accelerations

( $a = -5, -2, -1, -0.5, +0.5, +1, +2, +5 \text{ mm}/\mu\text{s}/\mu\text{s}$ )

5

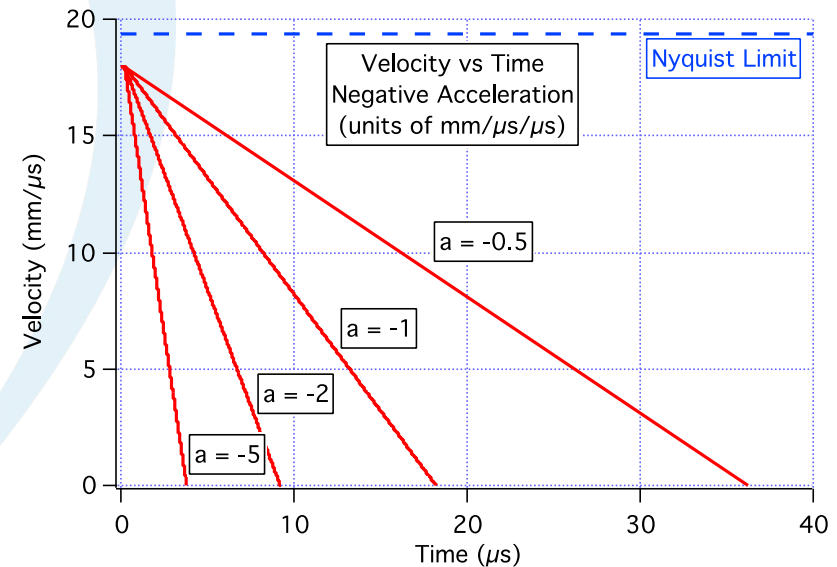
Accelerations have units of  $\text{mm}/\mu\text{s}/\mu\text{s} = 10^9 \text{ m/s}^2 = 10^8 g$

## Positive Accelerations



initial velocity = 0  $\text{mm}/\mu\text{s}$   
final velocity = 18  $\text{mm}/\mu\text{s}$

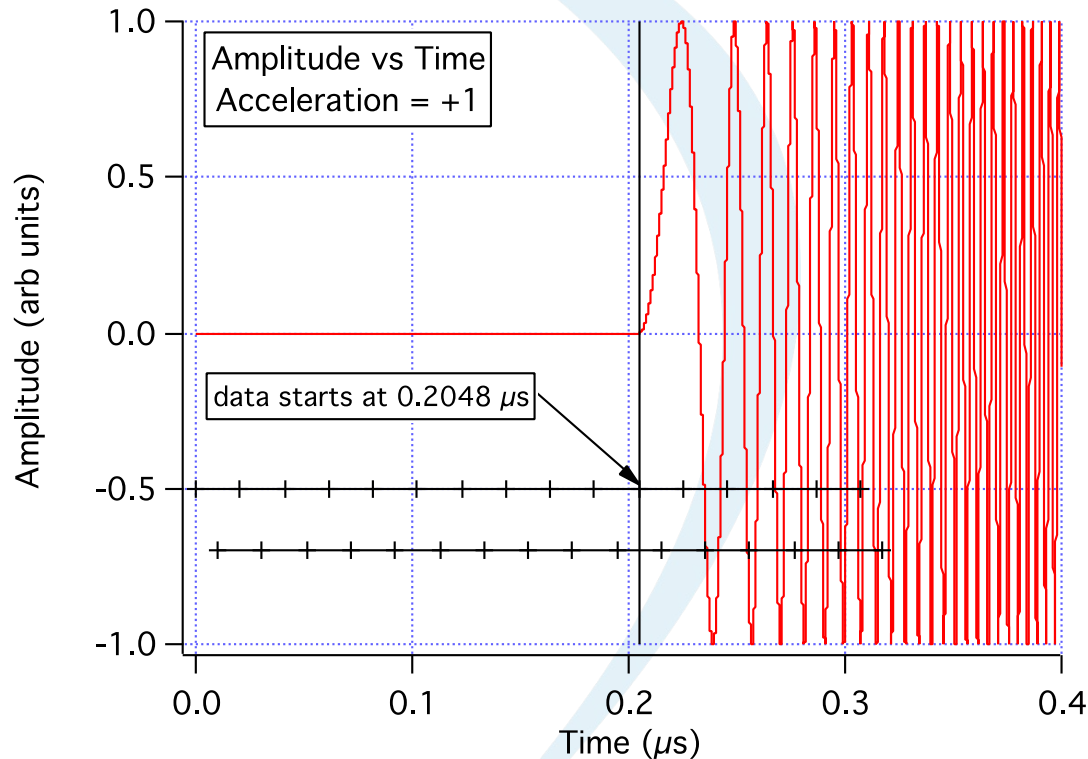
## Negative Accelerations



initial velocity = 18  $\text{mm}/\mu\text{s}$   
final velocity = 0  $\text{mm}/\mu\text{s}$

(Nyquist limit is 19.375  $\text{mm}/\mu\text{s}$  for digitizer sample rate = 50 GS/s.)

# Build beat waveforms using 8 different accelerations



Beat waveform parameters:

50 GS/s = 20 ps/pt

Lambda = 1554.13 nm (ITU29)

Process data using  $1024/512 = 0.02048 \mu\text{s}$  FFT windows

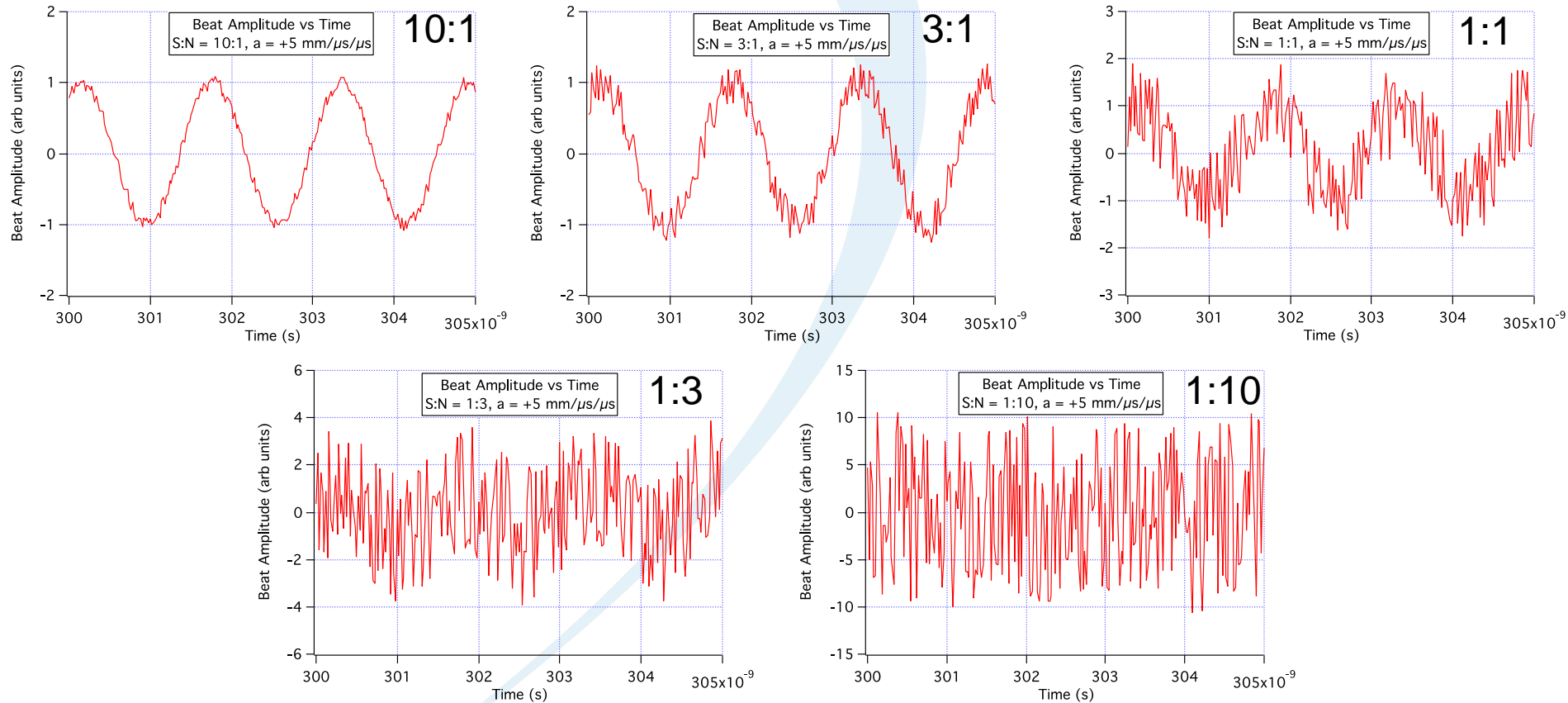
Use QuickView to process data.

Start data at 0.2048  $\mu\text{s}$  (21<sup>st</sup> FT window)

# And 5 different SNR values = 10:1, 3:1, 1:1, 1:3, 1:10

These beat waveforms are for acceleration = +5 mm/ $\mu$ s/ $\mu$ s.

Igor:  $b01ev = \sin(2 \cdot \pi \cdot d01ev \cdot 1e6 / 777.067) + \text{noise}(0.1)$



# We have 8 accelerations and 5 SNRs for each study

Velocity Error  
Velocity Uncertainty  
Acceleration Error  
Acceleration Uncertainty

Accelerations (mm/ $\mu$ s/ $\mu$ s)	Signal-to-Noise				
	10:1	3:1	1:1	1:3	1:10
-5					
-2					
-1					
-0.5					
+0.5					
+1					
+2					
+5					

We will be looking at 160 values.



# Look at the change in frequency for each FT window

Constant accelerations  $\geq$  linear velocities

$$v = at + b$$

Beat Frequency:

$$f_b = \frac{2f}{c} v = \frac{2}{\lambda} (at + b)$$

$$\frac{df_b}{dt} = \frac{2a}{\lambda}$$

$$df_b = \frac{2a}{\lambda} dt$$

$$\lambda = 1.55413\text{e-}3 \text{ mm}$$

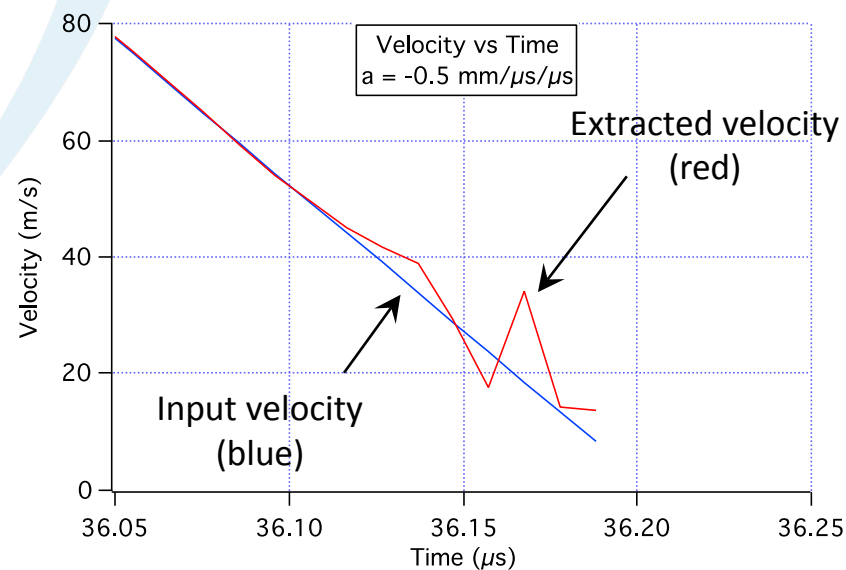
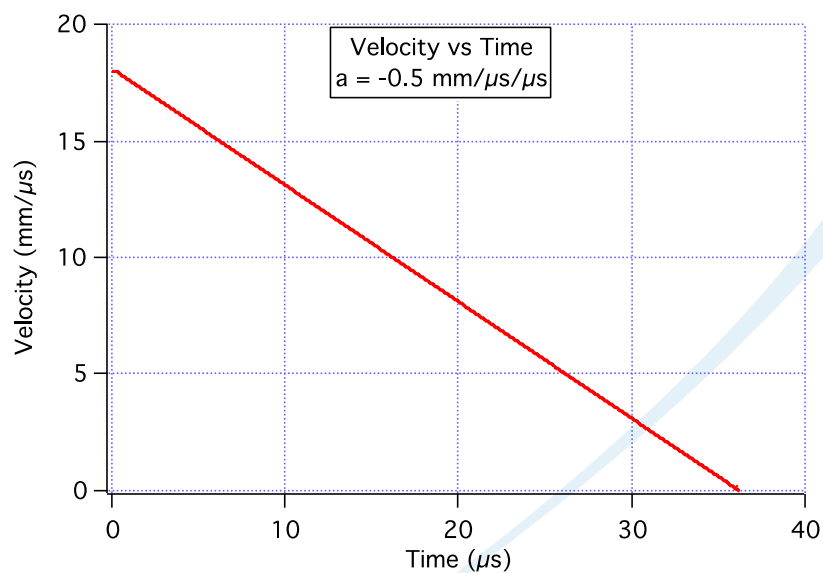
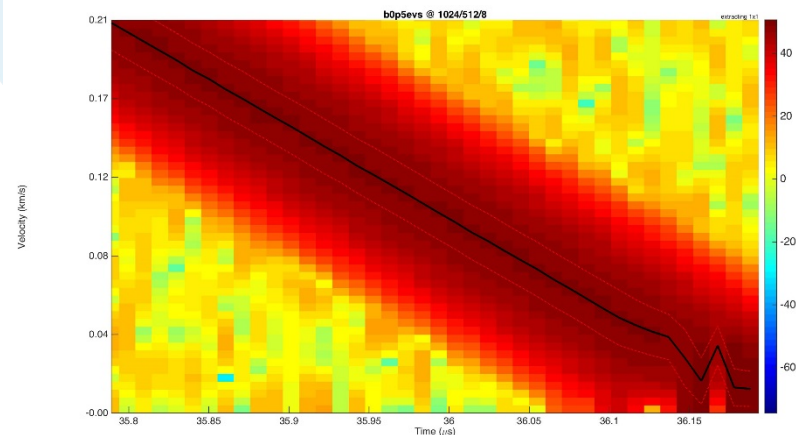
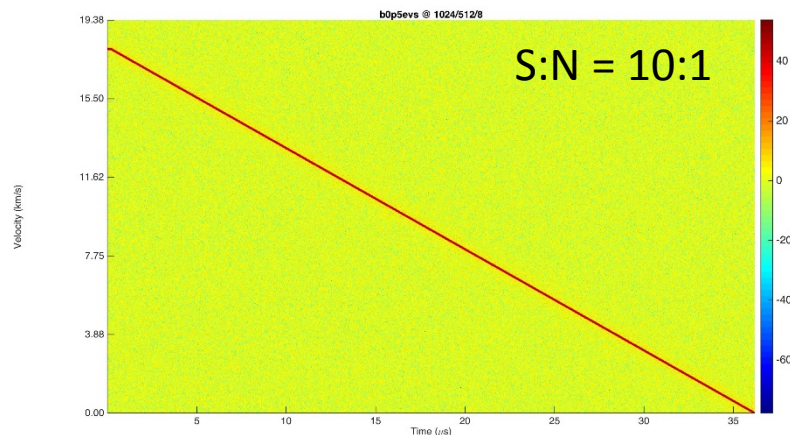
$$dt = 0.02048 \text{ } \mu\text{s}$$

a (mm/ $\mu\text{s}/\mu\text{s}$ )	df <sub>b</sub> (MHz)
0.5	13
1	26
2	53
5	132

Larger accelerations broaden the frequency peaks in the spectrogram.

Does this increase the error or uncertainty of the extracted data?

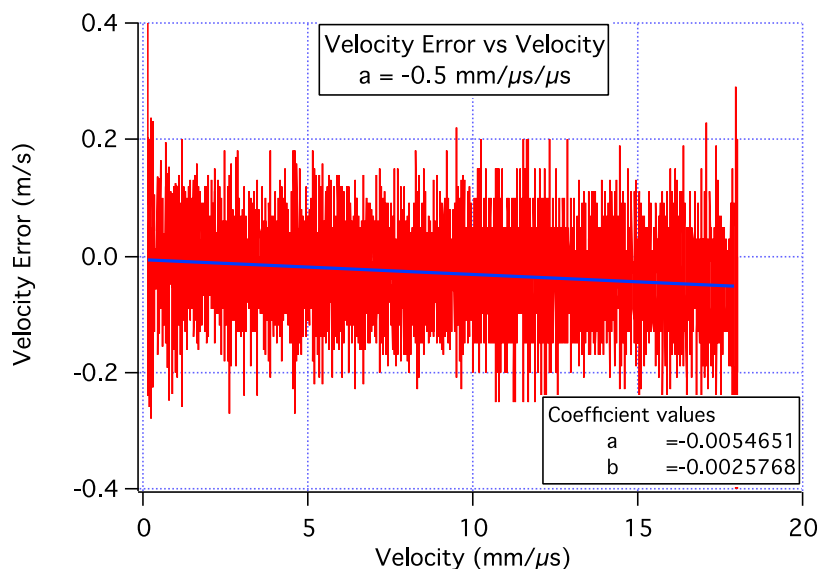
# Example of negative acceleration ( $-0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$ )



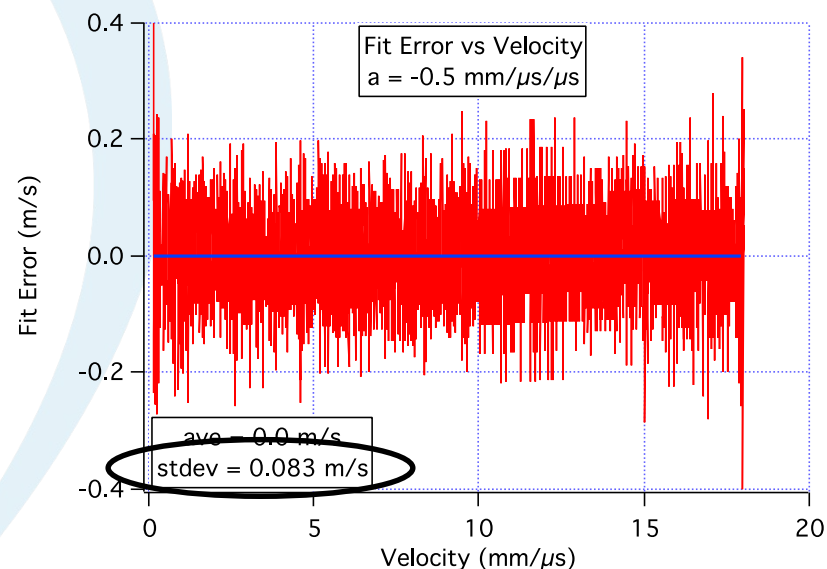
# Define velocity error and uncertainty

This example is S:N = 10:1, Acceleration =  $-0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$

Measure of Error



Measure of Uncertainty



Velocity Error = (extracted velocity) – (actual velocity)  
Use a linear fit to the velocity error as a measure of error.

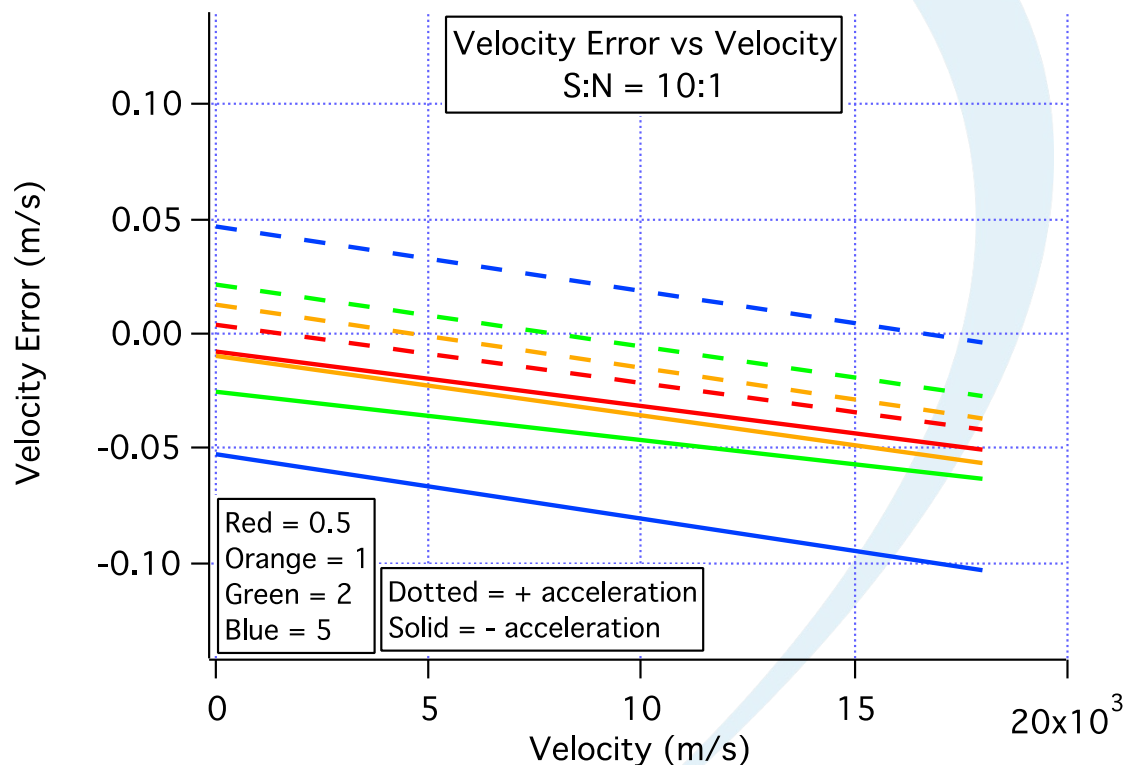
Fit Error = (Velocity Error) – (Fit to Velocity Error)  
Use 1 standard deviation of the fit error as a measure of uncertainty.

# Velocity Errors

Velocity Errors

# Velocity errors are functions of velocity

This example: SNR = 10:1 and Acceleration =  $\pm 0.5, \pm 1, \pm 2, \pm 5$  mm/ $\mu$ s/ $\mu$ s.



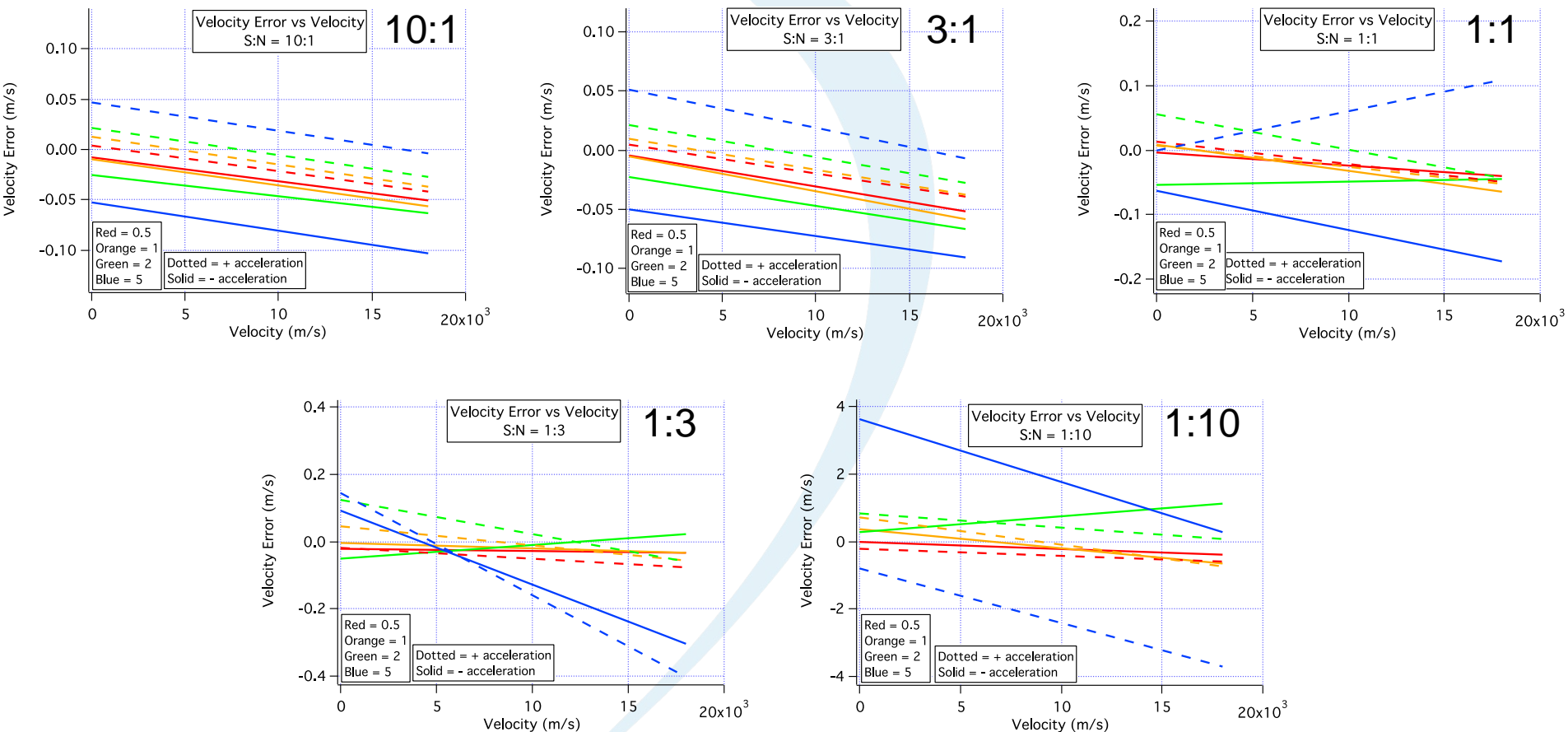
Notes for this case  
(SNR = 10:1):

All slopes are negative.

For negative accelerations,  
all errors are negative for  
all velocities.

Accelerations have units of mm/ $\mu$ s/ $\mu$ s.

# Summary of velocity errors versus velocity



Could in principle determine velocity error for any velocity  
with constant acceleration  $-5$  to  $+5$  mm/μs/μs and SNR = 10:1 to 1:10.

# Consider the magnitude of the velocity errors

(Would this make a good rule of thumb?)

There is no noticeable pattern to the velocity errors—especially as the SNR gets worse.

On the previous slide, notice the range of the vertical scales for the different SNRs.

Except for  $\sigma = 10$ , the ranges are all less than 0.4 m/s. Perhaps in most cases, it is good enough to know the maximum absolute value of the velocity errors.

Error <0.5 m/s is easy to remember.

Noise Fraction

$$\sigma = \frac{1}{\text{SNR}}$$

Magnitude of Velocity Errors  
(m/s)

$\sigma$	Max ABS(Error)
0.1	0.1
0.3	0.1
1	0.2
3	0.4
10	4

Constant accelerations  
-5 to +5 mm/ $\mu$ s/ $\mu$ s

# Velocity Uncertainties

---

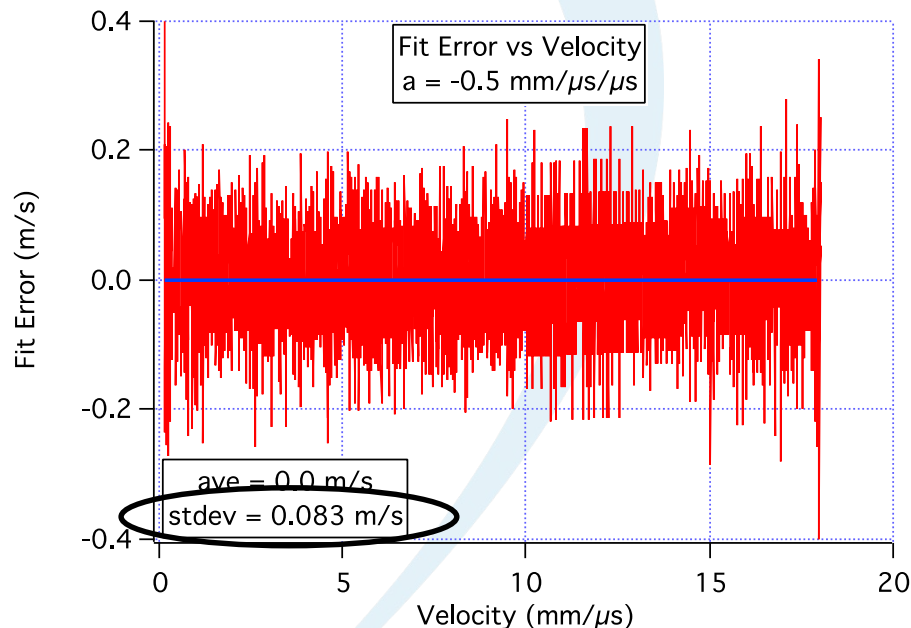
## Velocity Uncertainties



# Velocity uncertainties are independent of velocity

This example shows:

Acceleration =  $-0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$ , SNR = 10:1



Note:

After looking at all fit errors, it appears that the uncertainties are not functions of velocity.

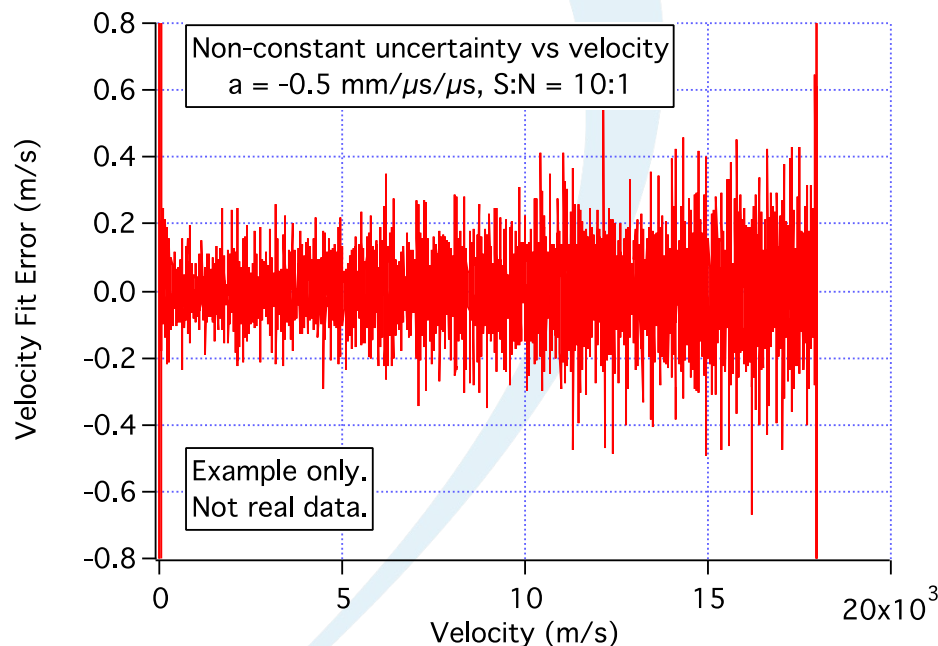
## Measure of Uncertainty

Fit Error = (Velocity Error) – (Fit to Velocity Error)

Use 1 standard deviation of the fit error as a measure of uncertainty.

# What would non-constant uncertainty look like?

I modified the amplitude of the following case:  
Acceleration =  $-0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$ , SNR = 10:1



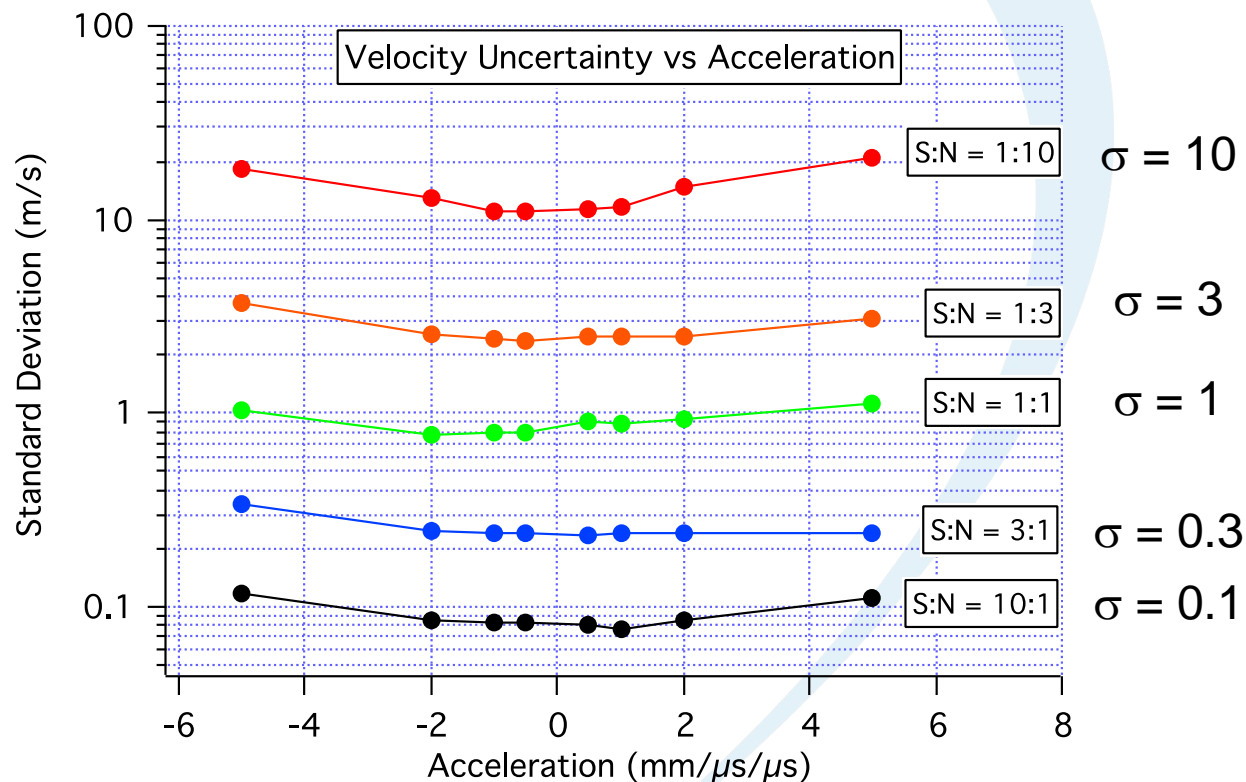
This example shows increasing uncertainty at higher velocities.  
None of the actual uncertainty plots looked like this.

# Summary of Velocity Uncertainty versus Acceleration

Uncertainty does not vary with velocity.

Noise Fraction

$$\sigma = \frac{1}{\text{SNR}}$$



Notes for velocity uncertainties:

Uncertainties are constant with velocity.

Uncertainties increase with increasing noise fraction.

Uncertainties increase weakly with acceleration.

Velocity Uncertainty (m/s)  $\approx$  Noise Fraction

← Interesting coincidence!

# Velocity uncertainty is related to the noise fraction

REVIEW OF SCIENTIFIC INSTRUMENTS **81**, 053905 (2010)

from Dan Dolan's paper:  
(eqn. 9)

## Accuracy and precision in photonic Doppler velocimetry

D. H. Dolan<sup>a)</sup>

*Sandia National Laboratories, Albuquerque, New Mexico 87185-1195, USA*

$$\Delta f = \sqrt{\frac{6}{N}} \frac{\sigma}{\pi \tau} \quad \longrightarrow \quad \Delta v = \left( \frac{\lambda}{2} \sqrt{\frac{6}{N}} \frac{1}{\pi \tau} \right) \sigma$$

where:

$\Delta v$  = velocity uncertainty

$\lambda$  = laser wavelength = 1554.13 nm

$N$  = FFT sample number = 1024

$\sigma$  = noise fraction = inv(SNR)

$\tau$  = FFT window length = 0.02048  $\mu$ s

Many thanks to Ed Daykin  
for reminding me of  
Dolan's analytic expression.

We obtain:  $\Delta v(\text{m/s}) = 0.93\sigma \approx \sigma$

(For this study with  $\lambda = 1554.13$  nm,  $N = 1024$ ,  $\tau = 0.02048$   $\mu$ s)

# Acceleration Errors

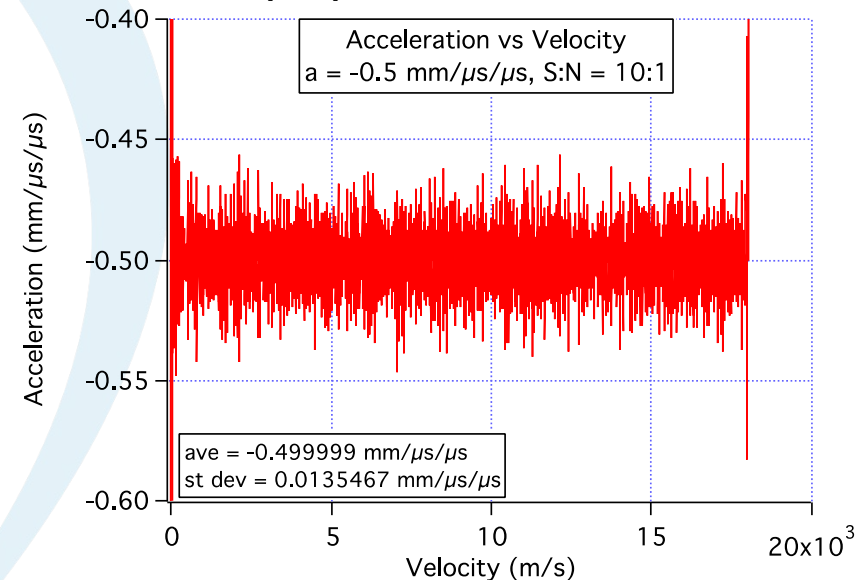
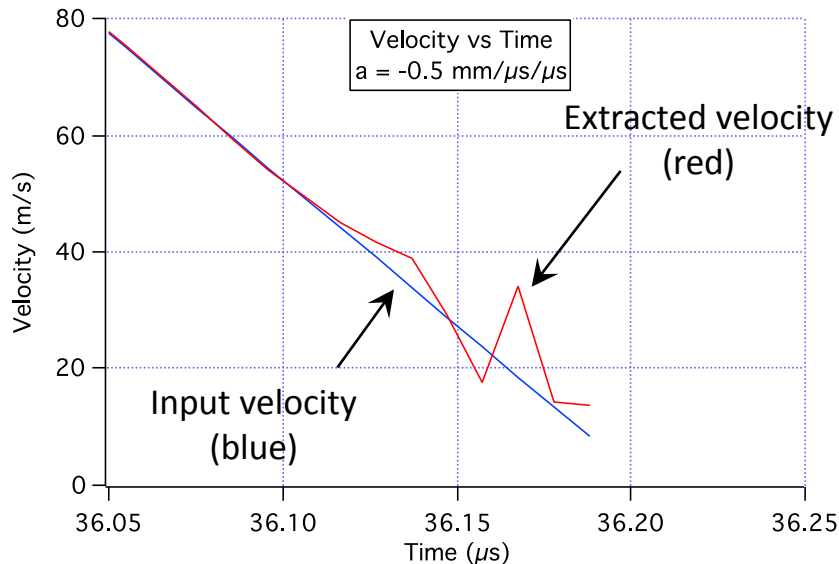
---

## Acceleration Errors

# Differentiate the extracted velocity profiles to obtain the acceleration profiles

22

This example is for acceleration =  $-0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$ , S:N = 10:1.



Acceleration = point-by-point derivative of the extracted velocity

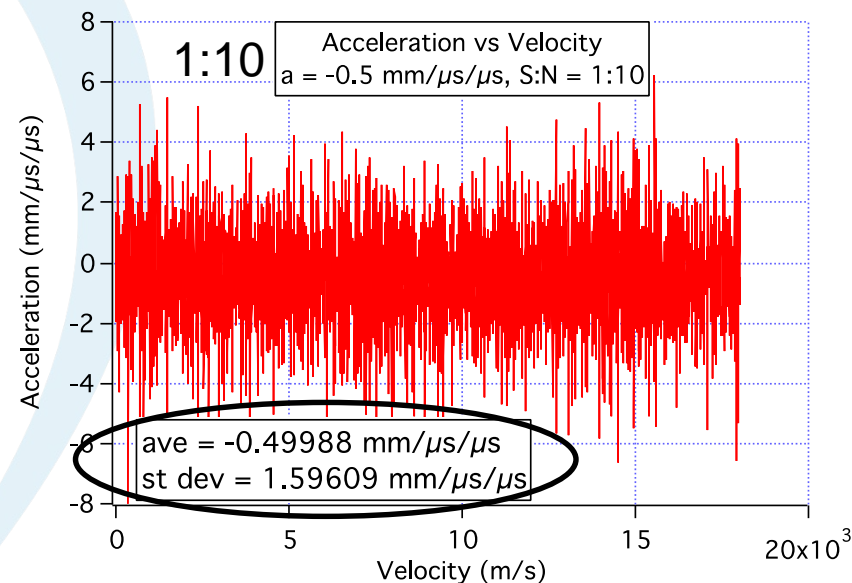
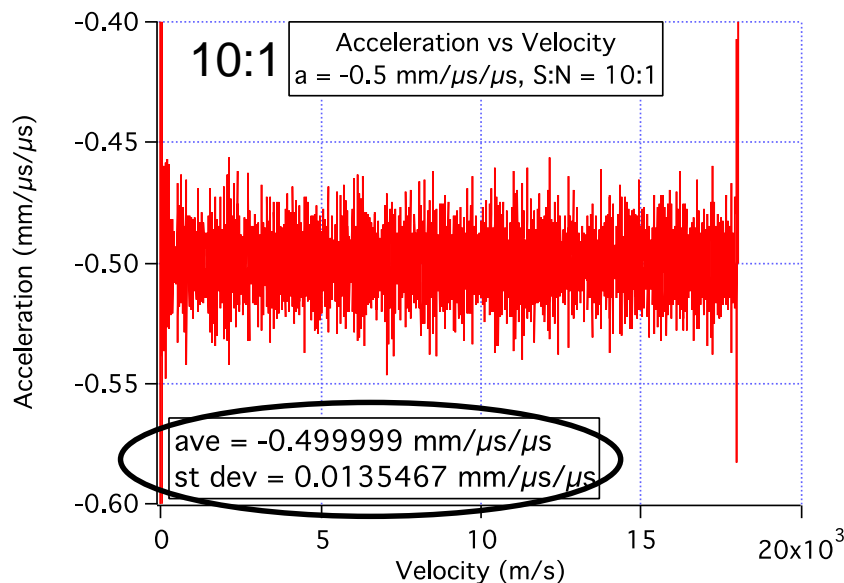
$$a_n = \frac{v_n - v_{n-1}}{t_n - t_{n-1}}$$

$$a = a(\text{mm}/\mu\text{s}/\mu\text{s})$$

I used Excel to calculate the accelerations.

# Acceleration errors and acceleration uncertainties are constant with velocity

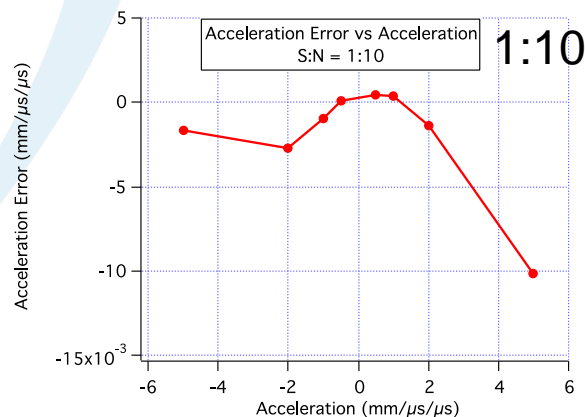
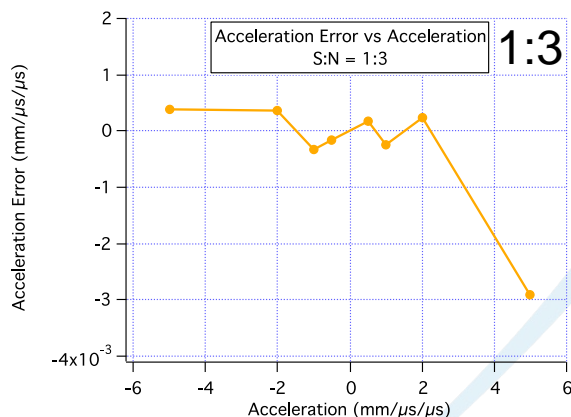
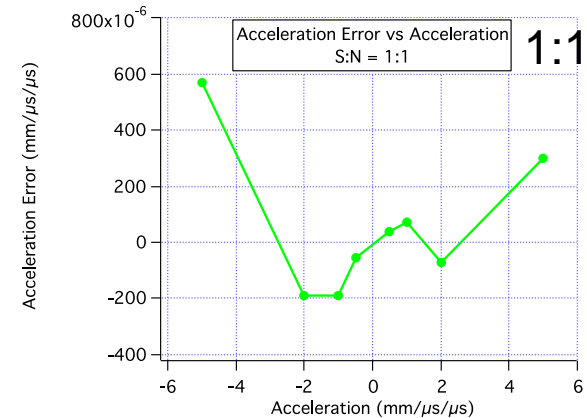
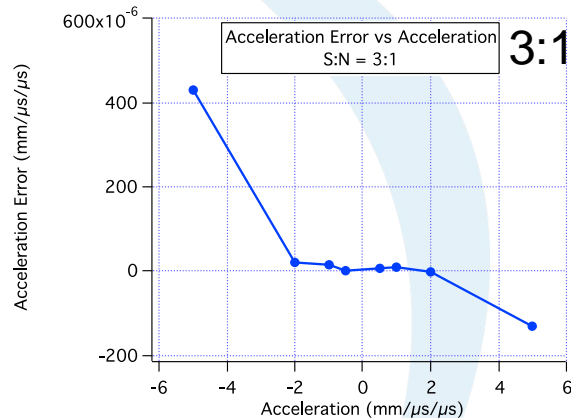
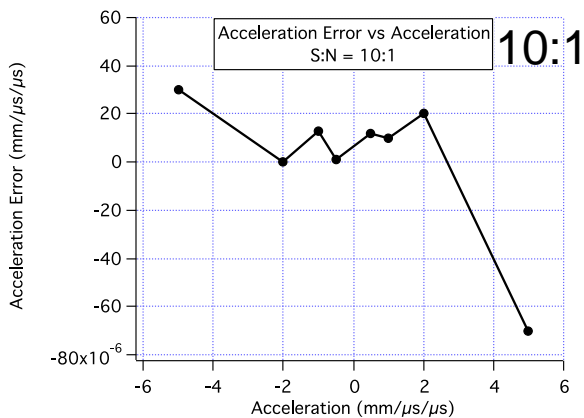
This example is for  $a = -0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$ .



Acceleration error = average acceleration – input acceleration

Acceleration uncertainty = 1 standard deviation of average

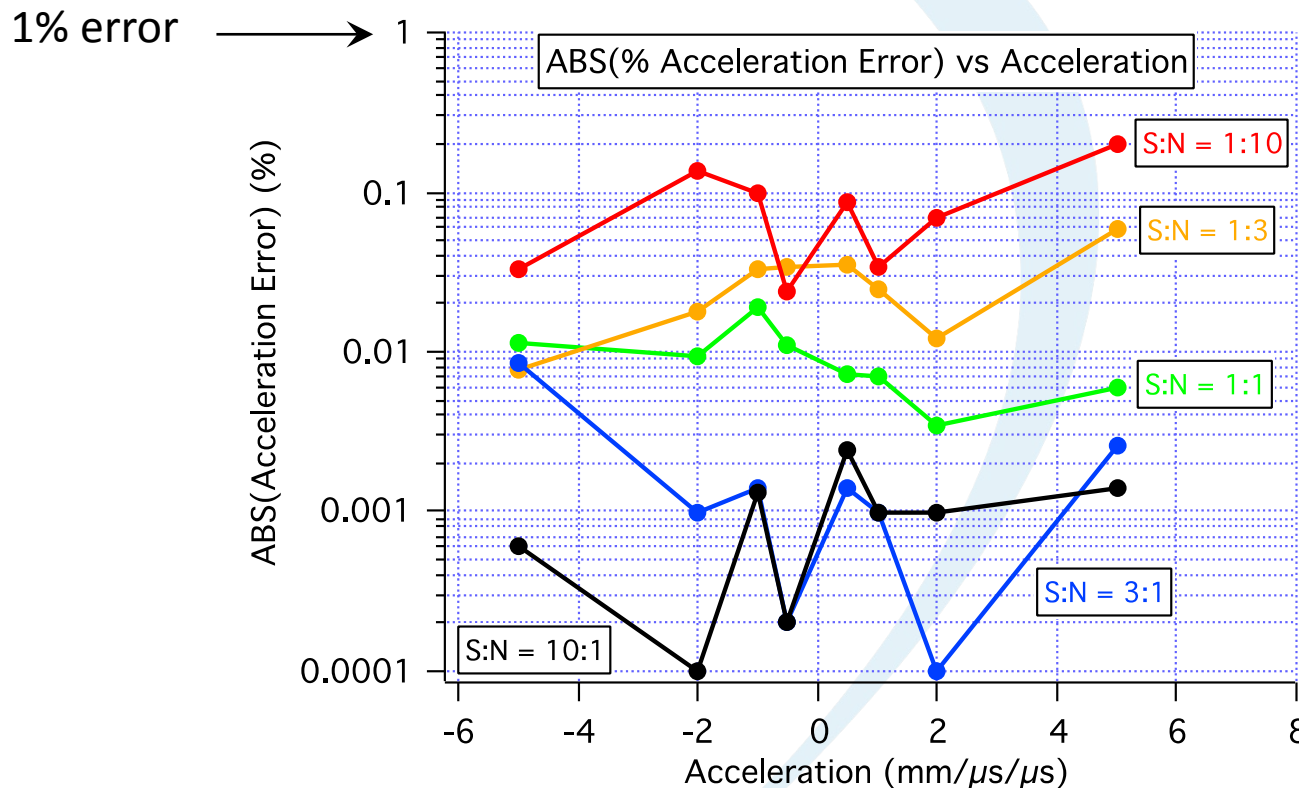
# Summary of acceleration errors versus acceleration



Acceleration errors are positive and negative, but extremely small.  
Look at magnitude of errors (as we did with velocity errors).



# The magnitudes of acceleration error are negligible



Notes for acceleration errors:

Errors are constant with velocity, but not constant with acceleration.

Errors increase with increasing noise fraction.

Errors are extremely small—especially with small noise fraction.

Acceleration errors are generally less than 0.1% for constant accelerations =  $-5$  to  $+5$  and  $\sigma = 0.1$  to  $10$ .

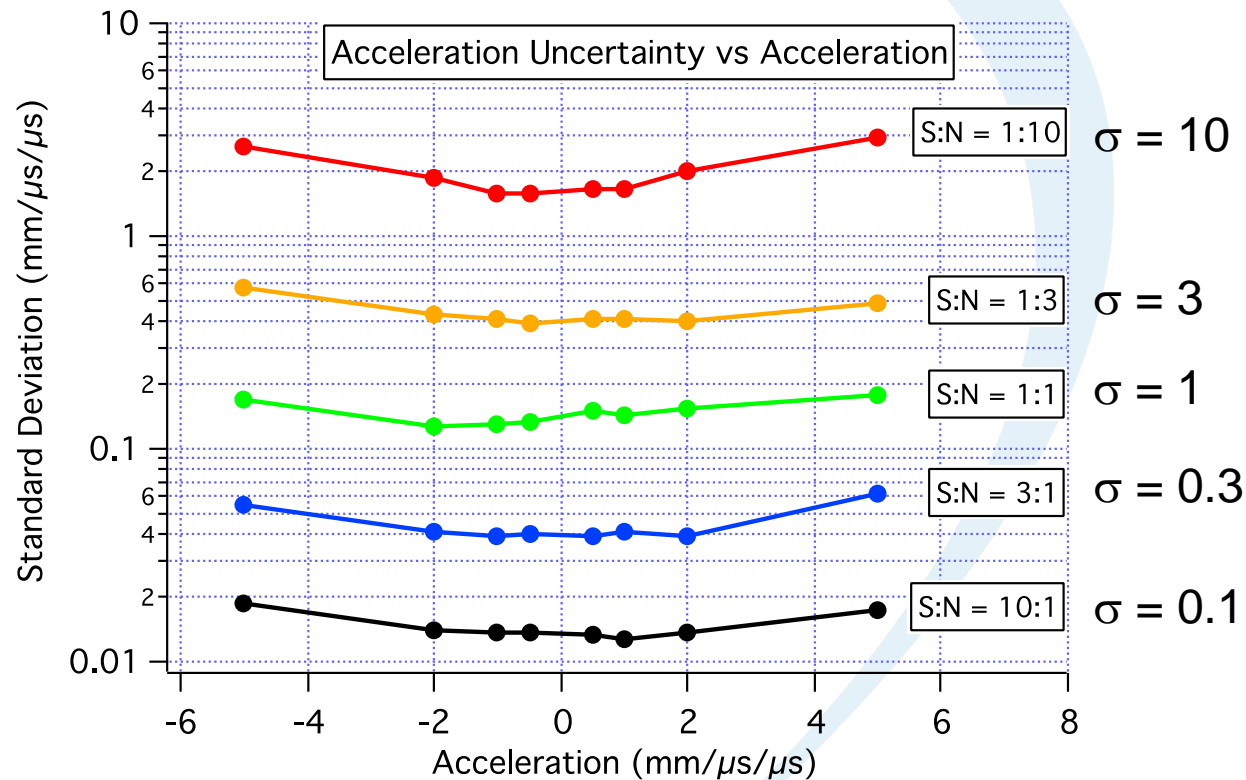
# Acceleration Uncertainties

---

## Acceleration Uncertainties

# Summary of acceleration uncertainties versus acceleration

27



Noise Fraction

$$\sigma = \frac{1}{\text{SNR}}$$

Notes for acceleration uncertainties:

Uncertainties are constant with velocity.

Uncertainties increase with increasing noise fraction.

Uncertainties increase weakly with acceleration.

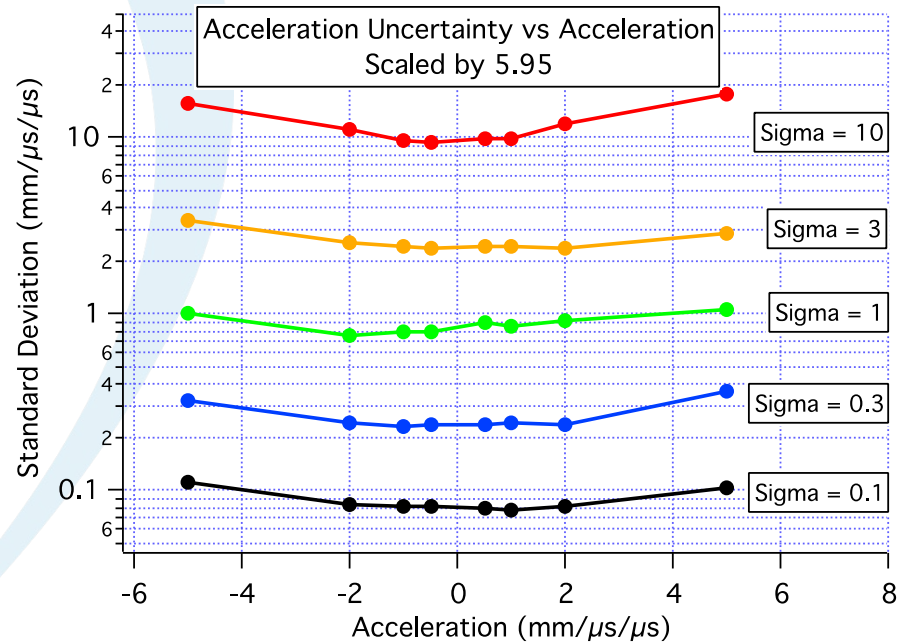
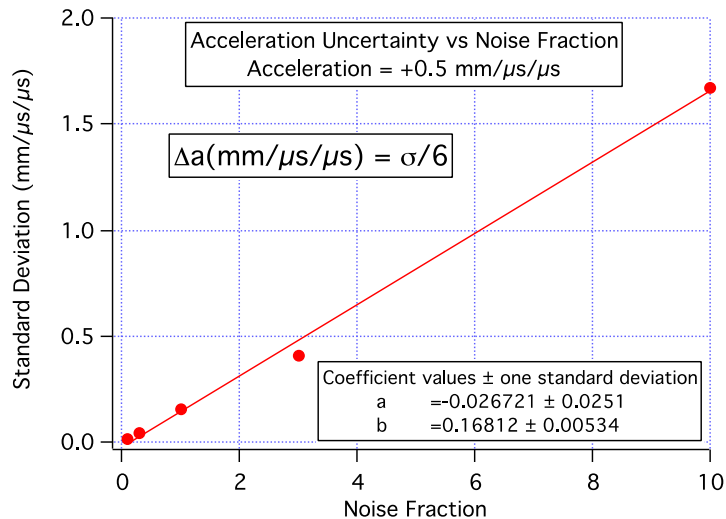
This looks similar to the velocity uncertainties.

Does the acceleration uncertainty scale linearly with noise fraction?

# Acceleration uncertainty might have a linear relationship to noise fraction

28

Use the data at  $a = +0.5 \text{ mm}/\mu\text{s}/\mu\text{s}$  to determine a scale factor.



$$\Delta a(\text{mm}/\mu\text{s}/\mu\text{s}) \approx \sigma/6$$

(For this study with  $\lambda = 1554.13 \text{ nm}$ ,  $N = 1024$ ,  $\tau = 0.02048 \mu\text{s}$ )

# Reminder: Determining Signal-to-Noise Ratio

---

Reminder: Determining Signal-to-Noise Ratio

# Use the RMS amplitude of the digitizer record to determine SNR(t,dB) for your PDV data

from: Low Noise Receiver/Scope Combinations For PDV,  
Kirk Miller, et al., PDV Workshop, 6/24/2014

$$\text{SNR}_{\text{TIME-DOMAIN,dB}} = 6.02 \cdot \text{ENOB} + 1.76 + 20 \log (2A/V)$$

E = effective bits for digitizer, V = full scale range, A = RMS amplitude of applied signal  
See Wiley Encyclopedia of Electrical and Electronics Engineering, Vol. 18, J. Blair

$$\text{SNR}_{f,\text{dB}} = 6.02 \cdot \text{ENOB} + 1.76 + 20 \cdot \log(2 \cdot \text{RMS}/V_{\text{FS}}) + 10 \cdot \log(N_{\text{FFT}}/2)$$

SNR(t,dB) = SNR in the time domain data (digitizer)

SNR(f,dB) = SNR in the frequency domain (spectrogram)

ENOB = effective number of bits for your digitizer

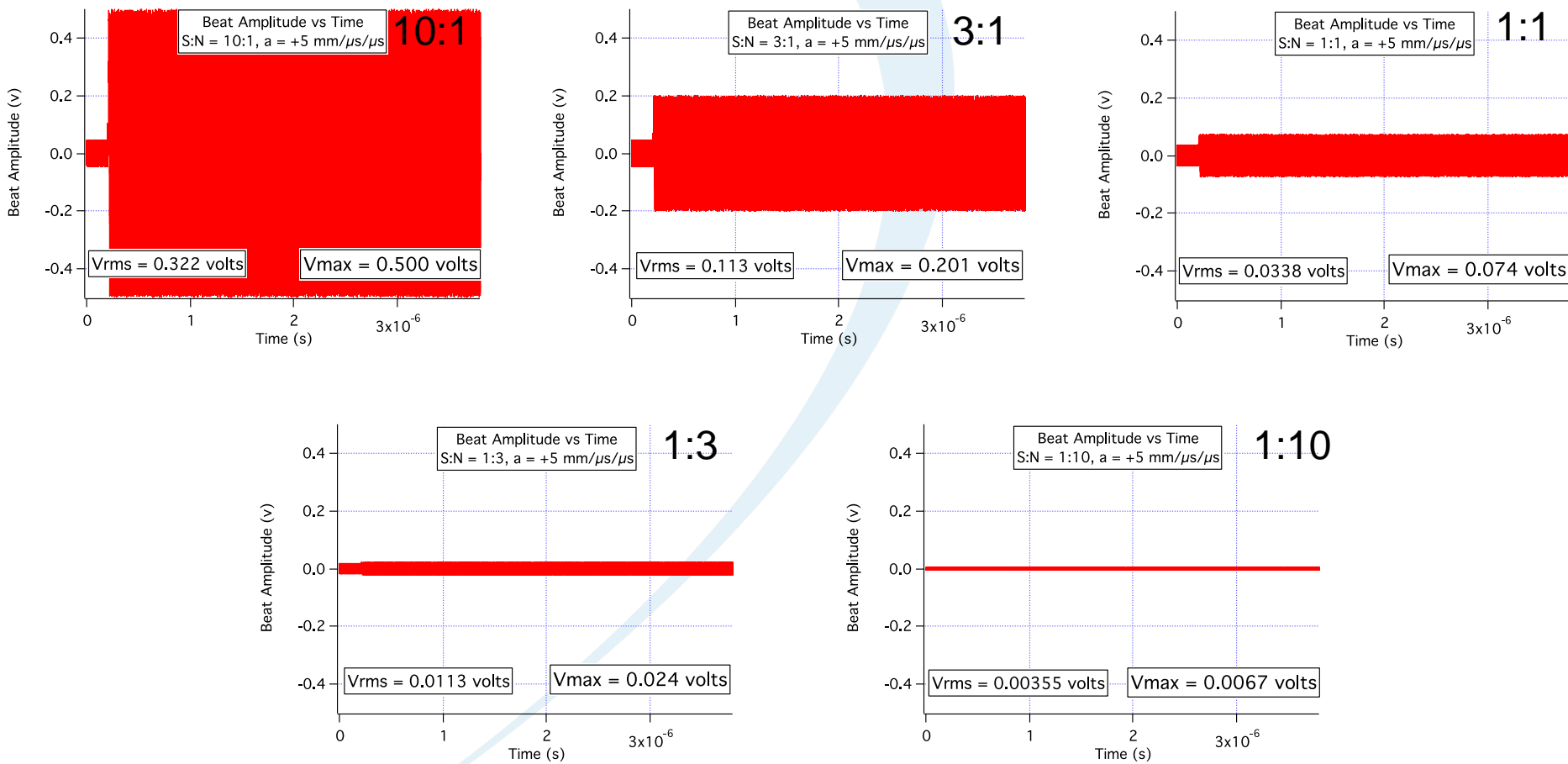
A = RMS = RMS amplitude of the time domain data

V = V<sub>FS</sub> = full scale voltage range of the digitizer setting

N<sub>FFT</sub> = number of digitizer points in each FT window

# This is what my 'data' would have looked like

These examples are for acceleration = +5 mm/ $\mu$ s/ $\mu$ s.



(no detector noise included)

# Conclusions—PDV errors and uncertainties

Generally good news ( $-5 \leq a \leq +5 \text{ mm}/\mu\text{s}/\mu\text{s}$ ,  $0.1 \leq \sigma \leq 10$ )

Velocity errors are functions of velocity, acceleration, noise fraction.

Errors  $< 0.5 \text{ m/s}$  for noise fraction  $\leq 3$ .

Errors  $< 4 \text{ m/s}$  for noise fraction  $= 10$ .

Velocity Uncertainties are constant with velocity.

Increase weakly with acceleration.

$\Delta v(\text{m/s}) \approx \text{Noise Fraction}$  (for this study).

Agrees with analytic expression given by Dolan.

Acceleration errors are constant with velocity.

Errors are functions of acceleration.

Increase with increasing noise fraction.

Errors are negligible ( $< 0.1\%$ ).

Acceleration uncertainties constant with velocity.

Increase weakly with acceleration.

$\Delta a(\text{mm}/\mu\text{s}/\mu\text{s}) \approx (\text{Noise Fraction})/6$  (for this study).

(A final reminder:  $50 \text{ GS/s}$ ,  $\lambda = 1554.13 \text{ nm}$ ,  $N = 1024$ ,  $\tau = 0.02048 \mu\text{s}$ )